# OWIDE: making ODEs first class Owl citizens

#### MARCELLO SERI

BERNOULLI INSTITUTE FOR MATHEMATICS COMPUTER SCIENCE AND ARTIFICIAL INTELLIGENCE UNIVERSITY OF GRONINGEN

#### TA-CHU KAO

COMPUTATIONAL AND BIOLOGICAL LEARNING LAB, DEPT, OF ENGINEERING

CAMBRIDGE UNIVERSITY

Ocaml Workshop, ICFP 23 Aug 2019



### Owl in brief - the library

Framework for Scientific Programming in O(2ml as fast as C but as concise as python

- GENERIC NDARRAY IMPLEMENTATION (including pure O(2ml base layer)
- -LARGE LINEAR ALGEBRA AND OPTIMIZATION API
- -DATAFRAMES AND ADVANCED STATISTICAL ANALYSIS LIBRARY
- -POWERFUL ALGORITMIC DIFFERENTIATION ENGINE
- -NEURAL NETWORK MODULE
- -PARALLEL AND DISTRIBUTED COMPUTATION ENGINE
  -SWAPPABLE BACKENDS (CPU, GPU, DAVASCRIPT,...)

#### Owl in brief - the team



CREATED OWL AND GUIDES ITS DESIGN



GPU/TPU BACKEND



MARCEUD SERI BUILD & RELEASE, ODES AND DYNAMICAL SYSTEMS



TA-CHU KAO ALGODIFF, NEURAL NETWORKS, ODES



A GROWING COMMUNITY OF DEVELOPERS, RESEARCHERS AND STUDENTS. CURRENTLY ACTIVE PROJECTS WITH GUILLAUME HENNEQUIN AND KC SIVARAMAKRISHNAN AND SOME OF THEIR STUDENTS.

# Scientific libraries and Ordinary Differential Equations

- · ORDINARY DIFFERENTIAL EQUATIONS MODEL A LARGE CLASS OF PHYSICAL, CHEMICAL AND BIOLOGICAL SYSTEMS
- · RECENTLY NEURAL ODE (20XIV: 1806.07366 2nd followups)
  MADE THEM RELEVANT ALSO FOR NEURAL METWORKS AND
  MACHINE LEARNING
- THEY APPEAR EVERY WHERE IN MATHEMATICS, PHYSICS AND THE OTHER SCIENTIFIC DISCIPLINES, AND HAVING INTERACTIVE DEMOS HELPS A LOT FOR THE UNDERSTANDING (USEFUL WHEN TEACHING AND LEARNING)

# Scientific libraries and Ordinary Differential Equations 11

PRESENT IN THE ECOSYSTEM OF PRETTY MUCH ANY PROGRAMMING-LANGUAGE WITH VARIOUS DEGREES OF COMPLETENESS AND FLEXIBILITY IN CLUDING OCAML! (FOR AN OVERVIEW: DOI 10.15200/winn.153459.98975)

AMONG MOST LIVELY ECOSYSTEMS

NN & ALGO DIFF

· PYTHON:

NUMPY (CPU) TENSORFLOW JAX

JULIA:

JULIA DIFFER, FLUX, ZYGOTE (20XIV: 1810.07951)

NN & FULL PROGRAM DIFFERENTIATION

- They also include amazing plotting libraries & can call each other...

## OW/DE: a library to integrate Ordinary Differential Equations

OWL PROVIDES NDARRAY, LINEAR ALGEBRA ALGODIFF, NEURAL NETWORKS AND SWAPPABLE BACKENDS (CPU, GPU, JAVASCRIPT).

CLANL PROVIDES POWERFUL TYPE SYSTEM, EASY ACCESS TO C LIBRARIES, REASONABLE CONCUSENESS AND GOOD SPEED.

ODE SOLVERS

OWLDE COLLECTS ALL OF THE ABOVE AND NATIVE OCAML IMPL. OF FIXED STEP, ADAPTIVE AND SYMPLECTIC OPE SOLVERS UNDER A SIMPLE, CAMPON INTERFACE

BONUS: PYML+MATPLOTLIB, GP+JUPLOT, JUPYTER, JS\_OF\_OCAML, WPY

#### DEMO TIME

- · OWLDE STRUCTURE AND INTERFACE
- · JUPITER NOTEBOOK AND JS\_OF\_ OCAML-BASED INTERACTIVE EXAMPLES
- . N-BODY SIMULATION W. COMPARISON WITH PYTHON & NUMPY-BASED IMPL
- · NEURAL ODE (COURTESY OF TA-CHU KAO)

MORE EXAMPLES ARE NOT DEMONSTRATED BUT ARE AVAILABLE AT GITHUB. COM/HSERI/OWLDE-DEMO-ICFP2019
GITHUB, COM/TACHUKAO/ADJOINT\_ODE
GITHUB. COM/OWLBARN/OWL\_ODE

### The Owl experience

#### THE GOOD

- · complete and fast framework · trivial to do large refactoring, even after having left the code to rot
- easy to compile to fast code or standalone javascript

#### THE BAD

- · terrible error messages (fixed -ish)
- · practically impossible to build (fixed -ish)
- · entangled component, side effects on import (fixed)
- · well documented but the documentation is getting stale (design in progress)

## A glimpse into the future

- · Accelerator project [CPUIGPUITPU] < MORE ON THIS IN
- · New sparse dete structure (and no more reigen pain)
- . Refreshed tutorial + online book
- · New integrators in owl-ode & support for event handling
- · High dimensional root finding module

## A vision for the project

Owl Ndarray could provide a building block to unity the scientific ecosystem in the Olaml world, but development is slowed down by the limited support.

ANY TYPE OF CONTRIBUTION IS WELCOME; bug reports, pul requests, feedback, collaborations in subprojects, research proposals, collaborations with interested industries....

Current open sub-projects (seeking help) can be found at OCAML. XYZ/PRODECT/PROPOSAL. HTML